Gabriel Eichler, PhD.

Solution team leader
Data & Analytics Workstream
Kraft Precision Medicine Accelerator











A recipe for insights

Question

+

Data Source

+

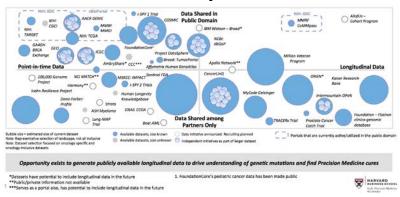
Analytical Method





Update to the KPMA Real World Data Landscape

2016 Data Landscape



Focus: Longitudinally, Openness, Funding Sources

Scope: Datasets of all sizes and types

Since 2016:

- Lots of new entrance are generating and consuming real world oncology data
- New data assets are becoming available commercially
- New registries and platform trials have burgeoned
- Massive investments in clinical data abstraction technologies and efforts

2018 Data Landscape

Focus: Integration of Molecular, Clinical, Longitudinally and Accessablity

Scope: Most significant datasets by size and disease focus; Dataset linkage and abstracted clinical data. US Focused.

Collected Meta-data in Q4 2017 - February 2018

Data Collection:

- Stakeholders Included for-profit and non-profit dataset owners
- Initially survey outreach with telephone follow-up as needed





















AACR





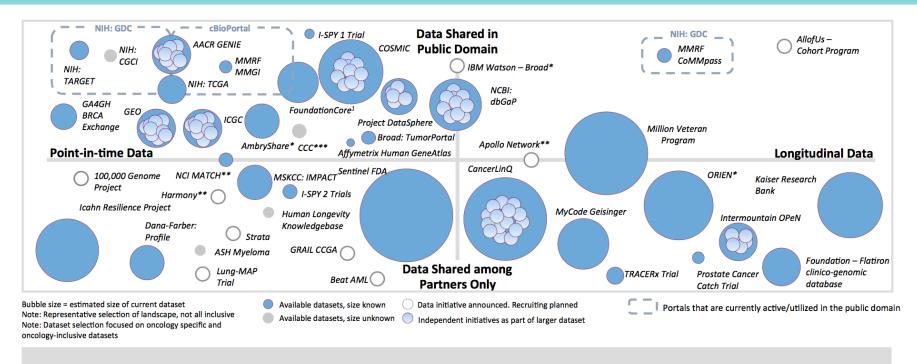








2016 Data Landscape



Opportunity exists to generate publicly available longitudinal data to drive understanding of genetic mutations and find Precision Medicine cures

- *Datasets have potential to include longitudinal data in the future
- **Public/private information not available
- ***Serves as a portal also, has potential to include longitudinal data in the future
- 1. FoundationCore's pediatric cancer data has been made public



2018 Data Landscape

10K

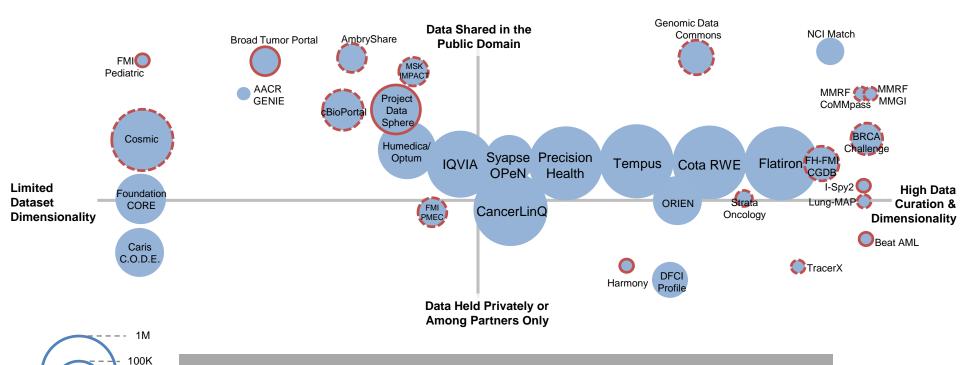
- 1K

No Support of Linkage

Does or Will Link Data

No border

Willing to Consider Linkage



Large, Integrated data assets are starting to emerge and advance real world data research – but platform trials and registries continue to have highly tuned data for particular diseases.

X-Axis: Dataset Quality refers to the integration of (a) molecular, (b) disease-specific, structured clinical, (C) longitudinal data Y-Axis: Higher up organizations are sharing openly and for free. Mid-axis organizations have commercial offerings and closed, private data are inaccessible to anyone

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Genomic Data Commons contains data from FoundationCORE, Broad's CCLE program, NCI's CCGI, TARGET and TCGA programs.

KEY FINDING ON 2018 DATA LANDSCAPE

Real World Assets Are Growing in Size and Sophistication:

- 25% growth in median size since 2016.
- Many organizations now exceed 1M patients in their dataset.
- Heavy investments in data abstraction.
- Patient registries have rich data tailored to specific diseases

Sharing and Linking Models are Winning:

Growing value of linked data assets:

- Flatiron + Foundation Medicine
- CancerLinQ + PH.AI + Tempus
- OPeN
- M2Gen / ORIEN
- HealthVerity (not shown on landscape)

Willingness to Share and Link Are Rising:

The largest data assets have embraced a willingness to link:

- Cota, Caris, DFCI Profile, and man others
- Many organizations indicate a willingness to share though consent and technical hurdles are prohibitive.

The Frontiers of RWD Are Advancing:

Advancing the frontier lies in

- Linked specimen banks
- Raw imaging datasets for radiomics
- Patient re-contact rights & mechanisms to enable additional research opportunities





Questions for Discussion

- What's your impression on the state of Real World Data?
- 2. Do you think that the field has progressed?
- 3. What's it going to look like 24 months from now?
- 4. What are the frontiers that will add the most value to data consumers?



Real World Data Analytics Landscapes





Healthcare Analytics Explosion

Swiss pharma company Roche is buying Flatiron Health for \$1.9 billion / Feb 15, 2018



Philips launches AI platform for healthcare

Published: March 1. 2018 The New York Times

Big Data, Analytics Ready to Meet Health Care Challenges

MAY 01, 2018

AI Holds Promise of Improving Doctors' Diagnoses

With artificial intelligence, machines can see what many humans may have missed Sept. 12, 2017 WSJ





Healthcare Analytics Uncertainty, Confusion and Concern

Amazon's Alexa Really Isn't Ready For Healthcare

Al Healthcare Revolution: Doctors and Data

Fight Chronic Challenges May 24, 2018 (NIERPPRISETECH



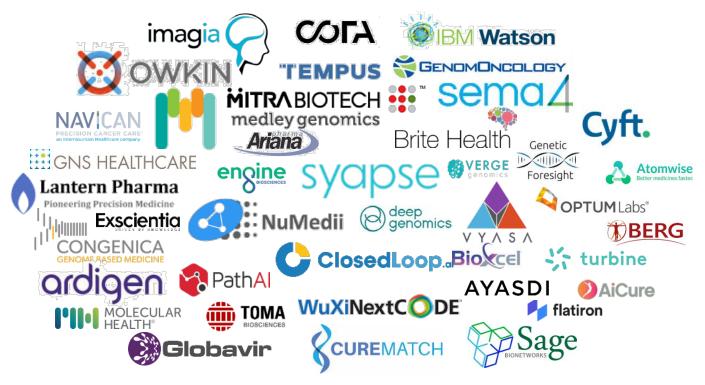
Artificial Intelligence In Healthcare: Separating Reality From Hype MAR 13, 2018 Forbes

IBM pitched its Watson supercomputer as a revolution in cancer care. It's nowhere close SEPTEMBER 5, 2017 STAT





Market is Complex and Lacks Direction on Emerging and Established Players







Key Stakeholders and Questions for Analytics Landscape

Stakeholders:

- Investors
- Researchers
- Non-Profits
- Hospitals/Care Centers
- Payers
- Patients

Questions:

- Who should I partner with?
- Who should I invest in?
- What sort of tech should I build or buy?
- What tech is most mature and may be used in treating patients in the near term?





Our Approach:

Companies analyzed:

- 48 Companies identified through online reports, conference agendas, etc.
- Primarily US-based

AlCure	Clinithink	GNS Healthcare	Owkin	Tempus
Ardigen	ClosedLoop.ai	Imagia	PathAl	TOMA Biosciences
Ariana Biopharma	Congenica	Lantern Pharma	Precision Health.ai	Turbine.ai
Arterys	COTA	Medley Genomics	Recursion Pharma	twoXAR
Atomwise	Deep Genomics	Mendel.ai	Resonant Therapeutics	Verge Genomics
Ayasdi	Deep6	Mitra Biotech	Sage Bionetworks	Vyasa
BenevolentAl	Engine Biosciences	Molecular Health	Sema4	WuXi NextCode
BERG Analytics	FDNA	Navican	SHYFT Analytics	Zebra Medical Vision
BioXcel	Genetic Foresight	NuMedii	Standigm	
Cellworks	GenomOncology	Numerate	Syapse	





Our Approach:

Companies excluded:

- 17 Companies identified initially but removed during data collection phase
- Excluded because either AI was too small a focus within the larger business, or insufficient data was found

Too Comp	lex
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Flatiron Health

IBM Watson

IQVIA

Luxoft

Optum Labs

Palantir

Insufficient Data

Brite Health Mozi.ai/

Curematch nQ Medical

Cyft Quantitative Medicine

Data4Cure Trials.AI

E-therapeutics

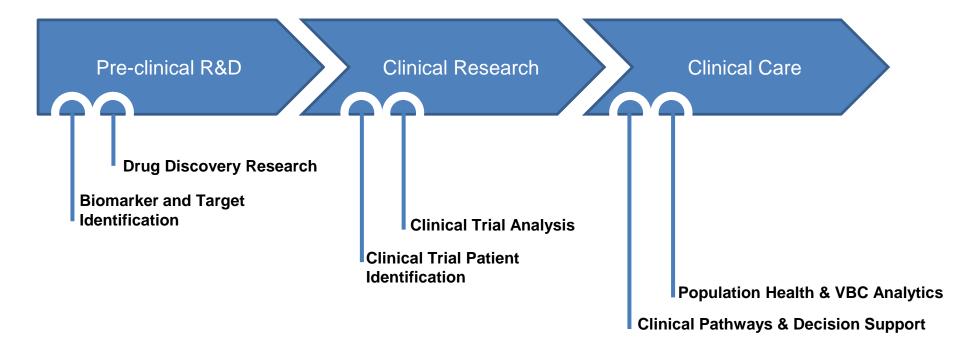
Exscientia

Globavir





Our Approach:







Our Scoring Methodology

Acceleration

April 2017- April 2018:

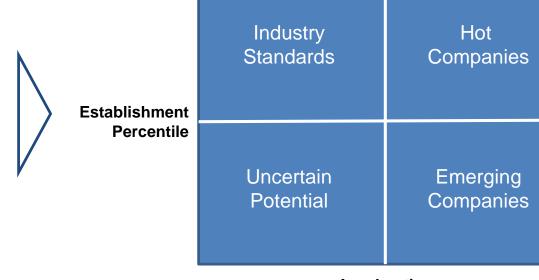
- Financing
- o % job growth
- % open positions



Establishment

Total Number of Announced:

- Publications/case studies
- Partnerships/customers
- Financing







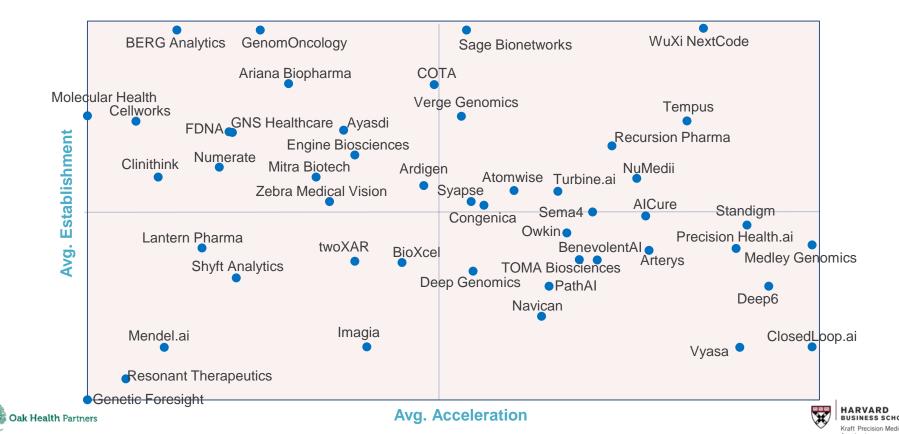


Some Notes and Limitations

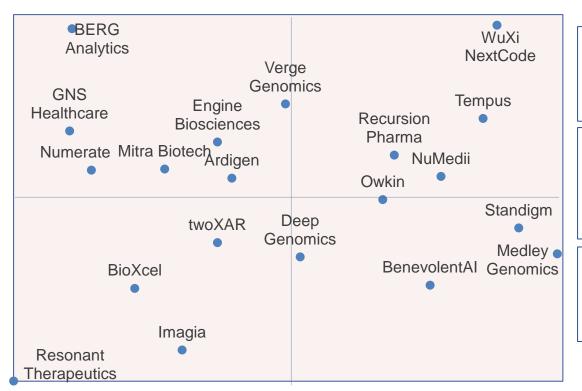
- US Focused
- Limited accuracy with small or large, complex organizations
- Quantifies organizations at the level of the company, not the specific capabilities.
- Trailing indicator with significant time sensitivity
- May fail to capture breakthrough innovators pursuing new use cases or opportunities.



All Companies Included in Analysis



Biomarker and Target ID Companies



Highlighted Co's

Wuxi NextCode

"A contract Genomics Organization"

- \$240M raised in Sept 2017
- Fast Company's Top 10 Most Innovative Companies 2018

Tempus

"Data-Driven Precision Medicine"

- \$80M Series B in March 2018
- Unicorn
- Licensed ASCO's CancerLinQ dataset
- 40+ Partnerships announced

Recursion Pharma

"We're aiming for 100 new treatments by 2025"

- \$60M funding in Oct 2017
- Partnership w/ Sanofi



stablishment

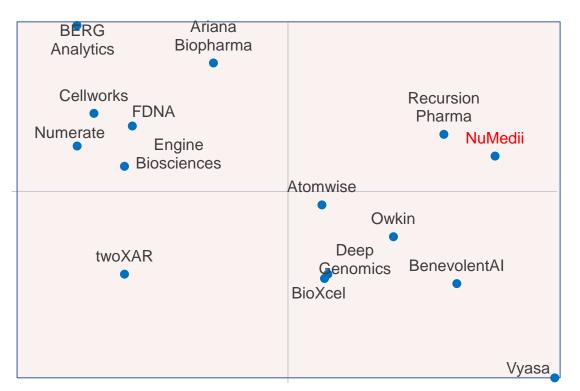
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Avg.



Drug Discovery Companies





Highlighted Co's

NuMedii

"Pioneering the use of big data, Al and Systems biology in Drug Discovery."

- Partnerships w/ Allergan, Astellas, Boehringer Ingelheim, Aptalis, Three Lakes, Treehouse
- 14 publications

Recursion Pharma

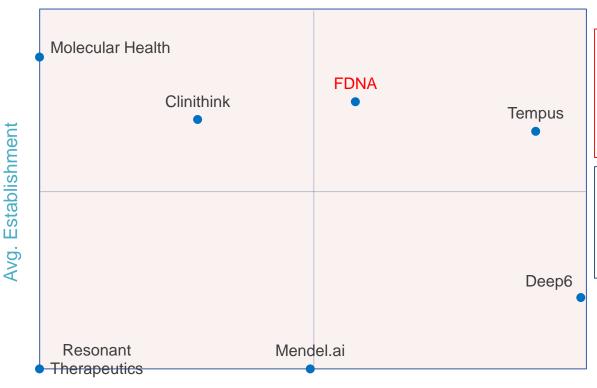
"We're aiming for 100 new treatments by 2025"

- \$60M funding in Oct 2017
- Partnership w/ Sanofi





Clinical Trial Patient ID Companies



Highlighted Co's

FDNA

"Genomic insights through next-generation phenotyping"

- 24% growth in headcount in 12 months.
- Partnerships in rare disease research at Vanderbilt Medical Center and the University of Hong Kong

Tempus

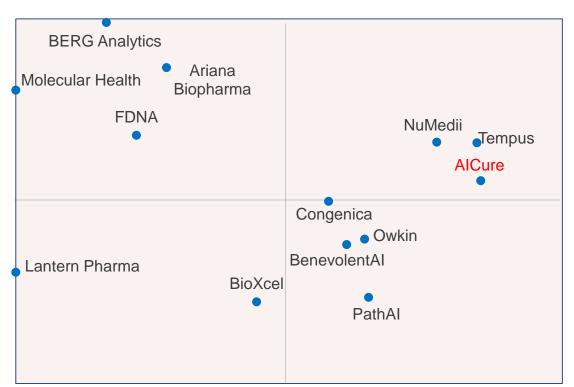
"Data-Driven Precision Medicine"

- \$80M Series B in March 2018
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- 40+ Partnerships announced



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Clinical Trial Analysis Companies



Highlighted Co's

AICure

"AiCure is bringing continuity of care to patients throughout the world"

- 50% headcount Growth in 1 yr.
- Nearly 100 patents
- \$27M in total funding
- Partnerships with WHO, Roche, Takeda, AbbVie

Tempus

"Data-Driven Precision Medicine"

- \$80M Series B in March 2018
- Unicorn
- Licensed ASCO's CancerLinQ dataset
- 40+ Partnerships announced

NuMedii

"Pioneering the use of big data, AI and Systems biology in Drug Discovery."

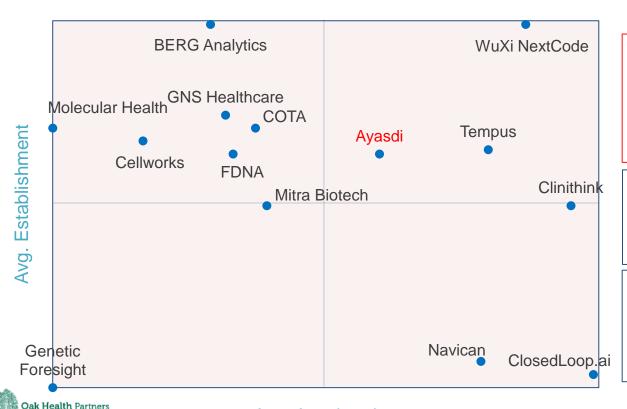
- Partnerships w/ Allergan, Astellas, Boehringer Ingelheim, Aptalis
- 14 publications



Establishment



Clinical Pathways & Decision Support Companies



Highlighted Co's

Ayasdi

"Rocket fuel for the journey to value based care"

- Partner with Stanford, Mt. Sinai, UCSF, UCSD, Columbia, LBNL, Karolinska, Harvard Med,
- Kleiner Perkins is an investor

Wuxi NextCode

"A contract Genomics Organization"

- \$240M raised in Sept 2017
- Fast Company's Top 10 Most Innovative Companies 2018

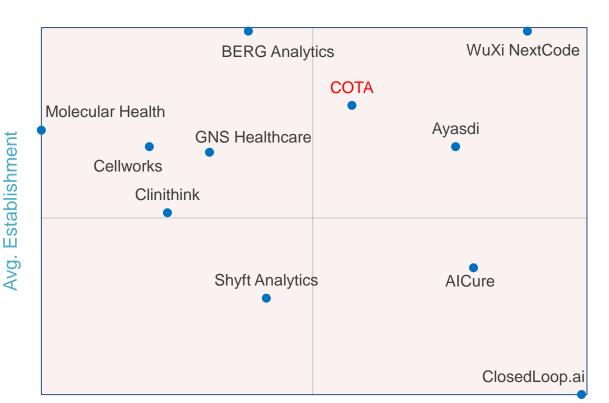
Tempus

"Data-Driven Precision Medicine"

- \$80M Series B in March 2018
- Unicorn
- Licensed ASCO's CancerLinQ dataset
- 40+ Partnerships announced



Population Health and Value-based Care Analytics



Highlighted Co's

COTA

"Improving the lives of cancer patients everywhere with data and technology"

- Just raised \$40 (with \$65M in total funding)
- Works closely with Memorial Sloan Kettering and many others.

Wuxi NextCode

"A contract Genomics Organization"

- \$240M raised in Sept 2017
- Fast Company's Top 10 Most Innovative Companies 2018

Ayasdi

"Rocket fuel for the journey to value based care"

- Partner with Stanford, Mt. Sinai, UCSF, UCSD, Columbia, LBNL, Karolinska, Harvard Med.
- Kleiner Perkins is an investor





Questions for Discussion

- 1. General reactions?
- 2. How do you see companies competing in this space?
- 3. How will analytics evolve over the next 24 months?
- 4. Why might we be seeing a limited number of major 'exits' by these companies?
- 5. What opportunities are there to improve what the services delivered by these companies?





A Special Thanks

Data Landscape:

- Daniel Evans
- Laura Fontana, Ph.D.

Other Support:

- Richard Hamermesh
- Kathy Giusti
- Krys Mroczkowski

Analytics Landscape:

- Ryan Karmouta, MD, MBA
- Michael Milligan, MD, MBA
- Garrett Buxton, MBA



